



Evaluation and validation of an automatic jaw movement recorder (RumiWatch) for ingestive and rumination behaviors of dairy cows during grazing and supplementation

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ABSTRACT

Observation of ingestive and rumination behaviors of dairy cows may assist in detecting diseases, controlling reproductive status, and estimating intake. However, direct observation of cows on pasture is time consuming and can be difficult to realize. Consequently, different systems have been developed to automatically record behavioral characteristics; among them is the RumiWatch System (RWS; Itin and Hoch GmbH, Liestal, Switzerland). Until now, the RWS has not been thoroughly validated under grazing conditions. The aim of the current study was to validate the RWS, against direct observation, in measuring ingestive and rumination behaviors of dairy cows during grazing and supplementation in the barn. A further objective was to examine whether it is possible to refine the algorithm used by the evaluation software RumiWatch Converter 0.7.3.2 to improve the accuracy of the RWS. The data were collected from an experiment carried out with 18 lactating Holstein cows in a crossover block design including 3 treatments and 3 measuring periods. All cows grazed night and day, 19 h/d, and were either unsupplemented or supplemented, with chopped whole-plant corn silage, or chopped whole-plant corn silage mixed with a protein concentrate. During the measuring periods, cows were equipped with the RumiWatch Halter, and their ingestive and rumination behaviors were recorded concurrently by the RumiWatch Halter and by direct observation (690 × 10 min). Comparison of concurrently measured data shows that the RWS detected jaw movements reliably, but classification errors occurred. A low relative prediction error of ≤ 0.10 for the number of rumination boluses, rumination chews, and total eating chews was found. A high relative prediction error of > 0.10 was found for the number of prehension

bites and time spent in prehension and eating. Both converter versions performed equally well in differentiating ingestive and rumination behaviors when cows were supplemented in the barn or when grazing and supplementation activities were combined. For grazing cows, with no supplementation, more reliable results for the total number of eating chews, rumination chews, prehension bites, and time spent in these activities were obtained, by using the RumiWatch Converter 0.7.3.11. In light of these findings, further research is warranted to improve the accuracy of the RWS and to allow a differentiation between mastication chews and prehension bites while eating.

Key words: automatic jaw movement recorder, dairy cow, grazing behavior, validation

INTRODUCTION

According to Penning and Rutter (2004), behavior exhibited by animals is an indication of the relationship between their internal state (e.g., nutritional requirements, health, or fertility) and their environment (e.g., feed offer, sward state, or climate). Thus, by monitoring behavioral characteristics, it may be possible to detect health disorders (González et al., 2008; Weary et al., 2009) and management deficiencies sooner. Consequently, reliable behavioral records are needed, and a robust relationship between the specific state and its associated behavioral characteristics must exist before valid statements about the animal's internal state can be made. Measuring the behavioral characteristics of dairy cows by direct observation, which is the current reference method, is time consuming and difficult for discrete behaviors such as biting or chewing without technical assistance. Tools to record behavioral characteristics for dairy cows exist, but their accuracy varies. In the past, to detect these behavioral characteristics, different sensing devices, such as electrical strain gauges (Beauchemin et al., 1989), silicon tubes packed with carbon granules (Rutter et al., 1997), acoustic

Received November 14, 2016.

Accepted November 16, 2017.

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monitoring systems (Ungar and Rutter, 2006), biaxial or triaxial accelerometers (Scheibe and Gromann, 2006; Oudshoorn et al., 2013), and pressure sensors (Nydegger et al., 2012) have been used. As mentioned by other investigators, some of these tools do not meet all requirements when it comes to measuring behavioral characteristics, were unsuitable for use in housing systems with head gates, or were unable to record single jaw movement (Nydegger and Keller, 2011; Zehner et al., 2012; Büchel and Sundrum, 2014).

The RumiWatch System (**RWS**), built in a cow halter, uses data gathered by a pressure sensor in combination with data collected by a triaxial accelerometer to detect different behavioral characteristics in dairy cows. Zehner et al. (2012) and Büchel (2014) reported that the RWS is able to record individual animal behavior over several days with high precision. Although extensively used in several studies, the only widespread validations of the RWS, to our knowledge, were published by Zehner et al. (2012) and Ruuska et al. (2016) for barn-fed cows.

In view of the prospective intention of using the RWS to record the quantification of pasture intake by grazing dairy cows based on behavioral characteristics, the first step must be to validate the most recent version of the RWS for grazing cows, with and without supplementation in the barn. Thus, behavioral characteristics recorded with the RWS, such as bolus counts, chews per bolus, number of eating chews, prehension bites, number of rumination chews, and derived durations such as rumination time, prehension time, and eating time were compared with continuous direct observation. If necessary, the refinement of the actual converter's algorithm was a further aim to increase the accuracy of the RWS.

MATERIALS AND METHODS

Experimental Design, Animals, and Housing

The study was carried out at the Agroscope experimental farm in Posieux, Switzerland (46° 45' 59.0" N, 7° 6' 17.2" E) between July 28 and September 27, 2014 (9 wk). All experimental procedures were in accordance with the Swiss guidelines for animal welfare and were approved (no. 2014_38_FR) by the Animal Care Committee of the Canton of Fribourg, Switzerland. Prior to selection of the cows, all possible cow candidates underwent a veterinary check-up. The experiment was performed as a crossover block design including 3 treatments and 3 periods. Each period lasted 21 d, consisting of 2 wk for adaptation and 1 wk for measurements. The recordings for the validation of the RWS lasted from Monday to Friday during the second adaptation

and the measurement weeks. Eighteen Holstein, or Red Holstein, dairy cows were used for the experiment; 12 of them were multiparous and 6 were primiparous. They were equally distributed in each of the 3 groups based on BW, ECM, and DIM. At the beginning of the experiment, the dairy cows had an average BW of 607 (SD 53) kg, were 122 (SD 45) DIM, had an average of 3.3 (SD 2.2) lactations, and produced 28.2 (SD 5.2) kg of milk/d.

The cows grazed during the day from 0730 to 1500 h, and during the night from 1730 to 0500 h the following morning. During the remaining periods, the cows were housed in a freestall barn, were milked, were sampled, and 2 of the 3 experimental groups were supplemented at weighing troughs (Insentec B.V., Marknesse, the Netherlands) either with 10 kg of DM/d of chopped whole-plant corn silage or with 8.2 kg of DM/d of chopped whole-plant corn silage mixed with 1.8 kg of DM/d of protein concentrate (supplemented cows). No supplementation was offered to the third group (un-supplemented cows), and by using the n-alkane double indicator method described by Mayes et al. (1986), individual herbage intake on pasture was estimated. Each cow served as its own control reference and underwent all 3 treatments. All cows from the 3 treatments grazed together in 0.3-ha paddocks. The paddocks were rotationally grazed by the cows for 1 to 3 d each, depending on pre- and postgrazing sward height (**POSH**). All sward heights were measured with an electronic rising plate meter (Jenquip, Feilding, New Zealand; 1 rising plate meter unit = 0.5 cm), and the target for POSH was fixed at around 8 rising plate meter units (**RPMU**), corresponding to 4 cm. The average pregrazing sward height was 15.5 (SD 3.9, n = 26) RPMU, corresponding to 1,287 (SD 696) kg of DM/ha above 8 RPMU. The average POSH was 7.6 (SD 0.9, n = 26) RPMU. The pastures were long established (>14 yr), composed of predominantly grasses 58% (SD 10%) fresh matter (mainly *Lolium perenne* and *Poa pratensis*), herbs 29% (SD 14%) fresh matter (mainly *Taraxacum officinale* and *Plantago lanceolata*), and legumes 13% (SD 6%) fresh matter (mainly *Trifolium repens* and *T. pratense*). On average, the experimental pastures were fertilized 3 times per year with a total of 125 (SD 25) kg/ha of ammonium nitrate (27% N, 2.5% Mg, 4.5% Ca, and 12% CaCO₃) and once with 45 m³/ha of farm-produced manure (corresponding to approximately 36 kg of N, 32 kg of P, and 113 kg of K per ha). The chemical composition of the herbage, whole-plant corn silage, and protein supplement fed during the experimental periods is reported in Table 1. During the whole experiment, cows had free access to water troughs and to mineral licking buckets (Ca, P, Mg; UFA 999, UFA AG,

Table 1. Average chemical composition of fresh herbage (n = 50), whole-plant corn silage (n = 3), and protein supplement samples (n = 3)

Item	Herbage		Corn silage		Protein supplement	
	Mean	SD	Mean	SD	Mean	SD
DM (g/kg)	162	29	398	34	882	23
Analyzed chemical composition (g/kg of DM)						
CP	199	21.0	77	5.8	583	1.0
NDFom ¹	351	80.8	315	34.8	105	8.2
Ash	111	8.1	32	0.3	59	0.5
Calculated energy concentration ²						
NE _L (MJ/kg of DM)	6.4	0.24	6.9	0.25	8.5	—

¹NDFom = NDF determined on an OM basis.²According to Agroscope (2015).

Herzogenbuchsee, Switzerland). The ambient outdoor temperature and amount of rainfall were recorded daily by a nearby meteorological station (Meteo-Schweiz, Station, Posieux, Switzerland). During the experiment, the average temperature was 14.8°C (minimum 10.0°C, maximum 19.9°C), and it rained on 27 out of 63 experimental days, resulting in an average daily rainfall of 6 mm (minimum 0.1 mm, maximum 11 mm).

Behavioral Measurements

Behavioral characteristics were recorded with the RWS (Itin and Hoch GmbH, Liestal, Switzerland) consisting of the RumiWatch Halter (**RWH**) shown in Figure 1. The RWH combines 2 sensors, a pressure sensor connected to a tube filled with propylene glycol for the detection of pressure changes, caused by jaw movements, and a triaxial accelerometer to detect 3-dimensional movements of the head. The pressure sensor and the tube are placed in a belt on the nose bridge of the cow. The triaxial accelerometer, the data logger, and a secure digital memory card are located on the right belt ring, mounted in a waterproof plastic box. In another box on the left belt ring, the batteries are incorporated. Data collected by the pressure sensor and the triaxial accelerometer were recorded with a frequency of 10 Hz and saved on the secure digital memory card. The setup and the handling of the RWH are similar to that of a standard cow halter. To ensure the best possible detection of the jaw movements by the pressure sensor, the belt around the nose and the lower jaw left 3 to 5 cm of movement space to the nose bridge and was located between 11 and 16 cm behind the nasal tip. The recorded data were read out by the RumiWatch Manager (version 2.1.0.0, Itin and Hoch GmbH) and processed through the evaluation software, called the RumiWatch Converter (**C2**, version 0.7.3.2, Itin and Hoch GmbH). According to the manufacturer's information, C2 allows for differentiation between the fol-

lowing behavioral characteristics based on RWH pressure data: number of rumination chews, bolus counts, chews per bolus, number of eating chews, drinking gulps, and other chews, along with the amount of time spent ruminating, eating, drinking, and other activities (Zehner et al., 2014). In our validation study, the focus was on the behavioral characteristics: chews per bolus, bolus counts, prehension bites, prehension time, number of eating chews, eating time, number of rumination chews, and rumination time. During the study, we developed a new RumiWatch Converter (**C11**, Itin and Hoch GmbH, Converter 0.7.3.11), which integrates the triaxial accelerometer data into the detection of ingestive and rumination behavioral characteristics. This converter was also validated for the same behavioral characteristics as C2.

To validate the RWS for recording ingestive and rumination behaviors, direct observations were performed. The direct observations and simultaneous RWS records were done on pasture for all cows (grazing cows) and additionally in the barn for supplemented cows (supplemented cows). A further evaluation was made with the in equal parts merged data sets of the grazing cows and the supplemented cows (supplemented grazing cows). Four days before the observations commenced, the cows were accustomed to the RWH. During an observation sequence, one cow was continuously observed for 10 min. The cumulative duration of observation for each cow lasted 300 min on pasture and 100 min in the barn. The same observer performed all validation sequences; this resulted in 540 sequences (3 experimental periods × 10 sequences × 18 cows) for grazing cows and 150 sequences (3 periods × 5 sequences × 10 cows) for supplemented cows. As the stay in the barn was limited, only 10 supplemented cows were observed. The 10 observed cows out of 12 were selected randomly before each observation day. To detect potential diurnal differences in the quality of the raw data recorded with the RWH, the observations were conducted throughout

Table 2. Definition of the behavioral characteristics used in the study

Characteristic	Definition
Prehension bites	Bites to gather or sever a bunch of feed (herbage) during feed intake.
Prehension time	Time spent taking prehension bites, including interruptions between prehension bites as long as 5 s.
Mastication chews	Chews performed throughout and shortly after eating for mechanical breakdown of the ingested material to finer particles. No regurgitated material is used.
Eating chews	Total number of prehension bites and mastication chews while eating.
Eating time	Time spent for eating chews, including interruptions between eating chews up to 5 s.
Rumination chews	Chews during rumination for mechanical breakdown of the regurgitated materials into finer particles using the molars.
Rumination time	Time spent for rumination chews including chewing interruptions up to 5 s.
Bolus count	A regurgitated mass of cud, which is swallowed again after chewing, counted when mass of cud is regurgitated.
Chews per bolus	Chews performed during rumination between the regurgitation and swallowing of 1 bolus.

the day from 0530 to 2100 h. The observed behavioral characteristics during these periods are precisely defined in Table 2. Using a tablet computer (Dell Venue 11 Pro, Dell GmbH, Geneva, Switzerland), the observed behaviors were recorded and saved in an Excel spreadsheet (Microsoft Excel 2010, Microsoft Deutschland GmbH, Hamburg, Germany). Specially developed macros linked to the buttons visible on the touchscreen counted and allocated the different behavioral elements

with the exact date and time in the Excel spreadsheet. To synchronize the timestamp of the aforementioned tablet computer and the RWS, the time of the RWS was set before each observation with the time of the tablet computer. Total number and duration of each observed behavioral characteristic was automatically summarized in a separate Excel spreadsheet. These summaries of the observed behavioral characteristics for the grazing, supplemented, and supplemented grazing cows were compared with simultaneously recorded RWH data processed with C2 or C11.

For problematic cases in relation to the eating chews, deviation >40% between RWS records evaluated with C2 and observation, an additional, manual evaluation was completed. The manual evaluation was carried out by counting the amplitude peaks of obvious eating chews, shown in the RumiWatch Viewer (RWV, Itin and Hoch GmbH) and recorded by the RWH, with an amplitude higher than 7,500 Pa. The manually evaluated data were then compared with the results of the observation at the same time interval. For an accurate observation and a correct registration of behavioral characteristics, the observer was trained 2 wk before the experiment in detecting the different, defined behavioral characteristics, maintaining the correct distance to the cows, and handling the computer tablet as well as the aforementioned Excel spreadsheet. Finally, the coefficient of determination ($R^2 = 0.97$, good agreement) was checked between a sample ($n = 17$) of manually counted eating chews based on RWV and the corresponding observed data (Figure 2).



Figure 1. Red Holstein cow wearing a RumiWatch Halter version 6.0 (Itin and Hoch GmbH, Liestal, Switzerland). 1: Belt around the nose including a pouch with a propylene glycol-filled tube and the pressure sensor. 2: Waterproof plastic protection box (left side: battery; right side: triaxial-accelerometer, data logger, and secure digital memory card). 3, 4, 5: Adjustment buckles at the side, on the neck, and under the lower jaw, respectively.

Laboratory Analysis

After collection, fresh herbage and corn silage were frozen until lyophilization. Subsequently, all feeds, protein supplement included, were milled. Afterward, DM (3 h at 105°C), ash (AOAC International, 1995, procedure 942.05), N (ISO, 2008; 16634-1, CP = N × 6.25), and NDF determined on an OM basis (AOAC

International, 1995, procedure 2002.4) content were analyzed.

Calculations and Statistical Analysis

The NE_L concentrations of herbage, whole-plant corn silage, and protein supplement were calculated according to Agroscope (2015). The accuracy of the 2 converters in detecting the behavioral characteristics was assessed by the mean prediction error (**MPE**; Bibby and Toutenburg, 1977) and the limits of agreement (**LoA**; Carstensen et al., 2008). The MPE, bias, and variance components to estimate the LoA were obtained using R (R Core Team, 2015) by fitting linear mixed models with the function `rlmer` of the R package `robustlmm` (Koller, 2014), taking into account the nonnormal distribution of the residuals. In addition, relative prediction error (**RPE**) was calculated by dividing the MPE by the median of each variable. High accuracy of the measuring system is characterized by a low RPE (Delagarde and Lamberton, 2015). Furthermore, a small range between the lower control limit and the upper control limit indicates good evaluation accuracy. Moreover, the mean absolute deviation percent (**MADP**) of each behavioral characteristic was calculated as follows:

$$\text{MADP} = \frac{\sum_{k=1}^N |\text{vis}_k - \text{RW}_k|}{\sum_{k=1}^N |\text{vis}_k|} \times 100\%, \quad [1]$$

where vis = observed behavioral characteristic x , observation ($k = 1$ to N), and RW = behavioral characteristic x measured automatically with the RWH and evaluated by C2 or C11, corresponding to observation ($k = 1$ to N). These variables were investigated for the 8 behavioral characteristics mentioned before.

RESULTS

Averaged across treatments, the cows consumed 10.6 (SD 2.98) kg of DM herbage/d and, if supplemented, on average 6.9 (SD 0.88) kg of DM supplemented feeds/d. They produced on average 23.3 (SD 4.6) kg of ECM/d.

The results of the comparison between C2 and the updated C11 against the observed behavioral characteristics are subsequently shown for the grazing, supplemented, and supplemented grazing cows.

Validation for Supplemented Cows

For supplemented cows, 150 observations and simultaneous records with RWH were carried out in total. Due to liquid leakage in the pressure sensor tubes, leading to sensitivity loss, only 121 (81%) RWH records were used for further evaluation. The behaviors are mutually exclusive, so some of the variables did not yield values on each sequence; therefore, between 33 and 58 observation sequences could be used to validate different behavioral characteristics in the barn. The

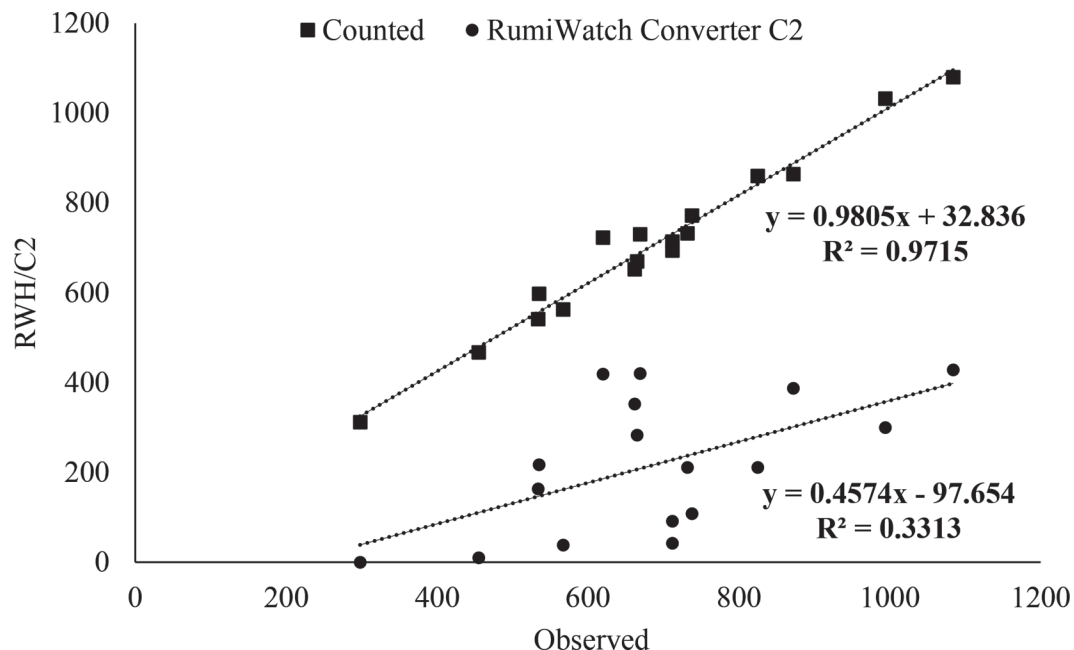


Figure 2. Relations of problematic cases between manually counted (based on RumiWatch Viewer; Itin and Hoch GmbH, Liestal, Switzerland) and automatically evaluated number of eating chews versus observed number of eating chews ($n = 17$ observations). RWH = RumiWatch Halter. C2 = RumiWatch Converter 0.7.3.2.

Table 3. Accuracy of RumiWatch (Itin and Hoch GmbH, Liestal, Switzerland) Converters 0.7.3.2 (Converter 2) and 0.7.3.11 (Converter 11) compared with direct observation in evaluating behavioral characteristics performed by the supplemented cows¹

Item	n	V ²	RW ²	MADP	Bias ³	P-value ⁴	LoA		Regression from direct to RW		MPE	RPE
							LCL	UCL	Intercept estimate	Slope estimate		
Converter 2												
Prehension bites ⁵	33	332	546	127	−88.9	<0.001	−525	348	18.8	1.59	164	0.49
Prehension time	33	198	494	173	−79.1	0.015	−403	245	18.4	1.92	120	0.61
Eating chews ⁵	58	201	546	21	0.1	1.00	−192	192	9.04	0.93	93.2	0.47
Eating time	58	174	494	22	−15.3	<0.001	−150	120	5.43	1.02	71.0	0.41
Rumination chews	53	598	601	7	−1.2	0.70	−66	64	0.21	1.01	32.4	0.05
Rumination time	53	600	598	6	−1.6	0.70	−88	85	1.59	1.00	43	0.07
Bolus count	53	11	11	10	0.31	0.001	−1.7	2.3	−0.05	0.94	0.89	0.08
Chews per bolus	53	51	54	23	−0.8	0.60	−33	32	0.04	1.03	16.6	0.32
Converter 11												
Prehension bites	33	332	473	137	−97.5	<0.001	−543	348	27.9	1.57	174	0.52
Prehension time	33	198	432	187	−87.4	<0.001	−419	244	26.6	1.89	129	0.65
Eating chews	58	201	473	26	−6.2	0.57	−237	225	17.3	0.92	113	0.56
Eating time	58	174	432	28	−21.6	0.006	−192	148	13	1.01	87.0	0.50
Rumination chews	53	598	600	10	3.6	0.48	−106	114	−1.51	0.99	54.4	0.09
Rumination time	53	600	598	7	1.9	0.69	−98	101	−0.11	0.99	48.5	0.08
Bolus count	53	11	11	12	0.37	<0.001	−1.9	2.7	−0.09	0.93	1.02	0.09
Chews per bolus	53	51	55	23	−0.2	0.90	−32	31	0.50	1.00	15.8	0.29

¹n = number of included records and observations. V = visual: median for number of, and time spent in, different behaviors observed directly (s/600 s; bites or chews/10 min). RW = RumiWatch: median for amount of time spent in different behaviors recorded by the RW Halter (s/600 s; bites or chews/10 min). MADP = mean absolute deviation percent; LoA = limits of agreement; LCL = lower confidence limit; UCL = upper confidence limit; MPE = mean prediction error (s/600 s; bites or chews/10 min); RPE = relative prediction error.

²The median is less sensitive to extreme values compared with the arithmetic mean.

³The bias is the fixed effect of the reference method (visual) compared with the instrumental method as estimated by the function `rlmer` of the R package `robustlmm` (Koller, 2014). It may be interpreted as the mean systematic error of the instrumental method.

⁴H₀: bias = 0.

⁵Out of 58 observation sequences with eating chews, only in 33 sequences prehension bites were observed. In the remaining 25 sequences, only few mastication chews were seen, leading to this apparently contradictory result.

sum of the observed number of prehension bites and mastication chews during eating were used as a reference for the number of eating chews.

Table 3 shows the validation results of the behavioral characteristics, evaluated using C2 and C11, for supplemented cows. The MADP between C2 and directly observed data were smaller for all behavioral characteristics, besides chews per bolus, when compared with the MADP of C11 and direct observation. Further, the slopes of the regression lines between C2 and the observed data for all behavioral characteristics, except prehension bites (about 1.6) and time (about 1.9), ranged between 0.93 and 1.03, and between 0.92 and 1.01, using C11. The RPE and the LoA for bolus counts, number of rumination chews, rumination time, prehension bites, prehension time, number of eating chews (Figure 3), and eating time were smaller when evaluated by C2 compared with C11, but not for chews per bolus. The MADP for chews per bolus was similar when data were evaluated either by C11 or C2. Bias between observations and data processed by C2 and

C11, respectively, were found for bolus counts ($P = 0.001$ and $P < 0.001$), number (both $P < 0.001$), time of prehension ($P = 0.015$ and $P < 0.001$), and eating time ($P < 0.001$ and $P = 0.006$).

For supplemented cows, the comparison between C2 and C11 showed no differences ($P = 0.54$) for prehension bites, prehension time ($P = 0.59$), number of eating chews ($P = 0.54$), eating time ($P = 0.59$), number of rumination chews ($P = 0.43$), time spent for rumination ($P = 0.57$), bolus counts ($P = 0.38$), or chews per bolus ($P = 0.86$; Table 4). This indicates that both converters performed equally well for this condition.

Validation for Grazing Cows

For grazing cows, a total of 540 observations and simultaneous records using the RWH were collected. Due to the aforementioned technical problems, only 425 (79%) RWH records could be used for further evaluation. The behaviors are mutually exclusive, so some of the variables did not yield values on each sequence;

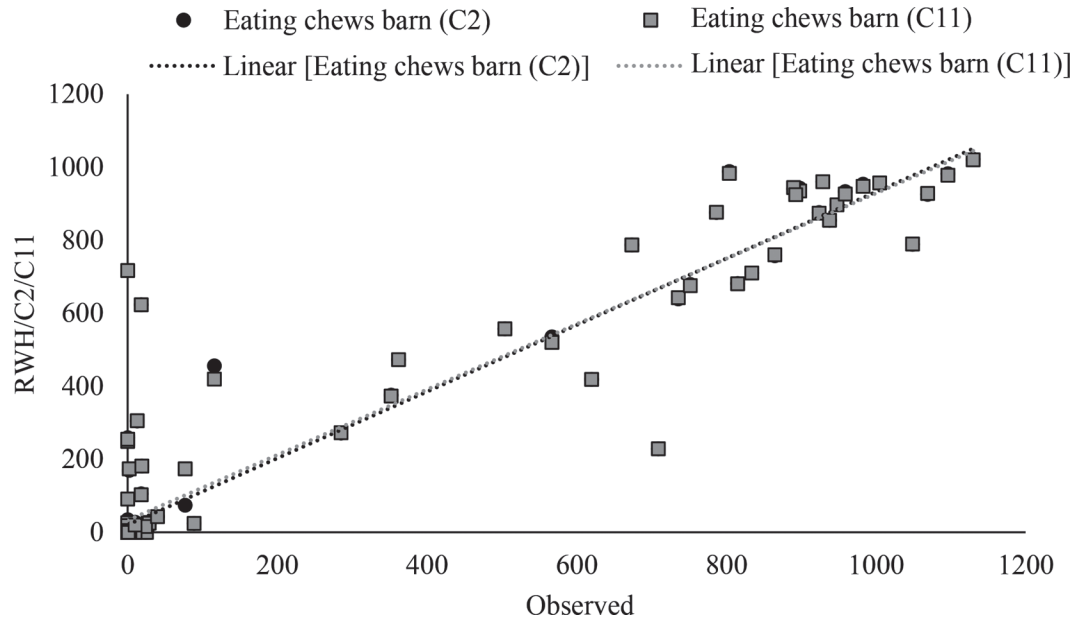


Figure 3. Relation of automatically evaluated [RumiWatch Converters 0.7.3.2 (C2) and 0.7.3.11 (C11); Itin and Hoch GmbH, Liestal, Switzerland] number of eating chews performed by supplemented cows versus observed number of eating chews ($n = 58$ observations). RWH = RumiWatch Halter.

therefore, between 78 and 336 observation sequences could be used for validation. The sum of the observed number of prehension bites and mastication chews during eating were used as a reference for the number of eating chews.

Table 5 summarizes the validation results of C2 and C11 for grazing cows. The MADP between C11 and observations were smaller for all behavioral characteristics compared with C2. Furthermore, the slopes of the regression lines between C11 and the observed data for all behavioral characteristics ranged from 0.91 to 1.18, and from 0.89 to 1.15 for C2. When compared with direct observation, the RPE and the LoA for all behavioral characteristics were smaller when evaluated with C11. Bias between observation and data evaluated by C11 was found for bolus counts ($P < 0.001$), prehension bites ($P < 0.001$), prehension time ($P < 0.001$), number of eating chews ($P < 0.001$; Figure 4), and eating time ($P < 0.001$). For C2, differences with direct observation were found for prehension bites ($P < 0.001$), prehension time ($P = 0.001$), number of eating chews ($P < 0.001$), eating time ($P < 0.001$), number of rumination chews ($P = 0.008$), and rumination time ($P = 0.005$).

Comparing the processed results by C2 and C11 for grazing cows, differences were found for prehension bites ($P = 0.009$), prehension time ($P = 0.008$), number of eating chews ($P = 0.009$), eating time ($P = 0.008$), number of rumination chews ($P = 0.009$), and time spent for rumination ($P = 0.008$; Table 4).

Validation for Supplemented Grazing Cows

The validation of C2 and C11 for the supplemented grazing cows was performed by the aid of 242 observations and simultaneous records collected with the RWH. All 121 usable RWH records done for supplemented cows in the barn, and 121 records randomly selected from the 425 usable records for grazing cows, were included. As parts of the behavioral characteristics are mutually exclusive, between 74 and 155 observation sequences were used to validate the different characteristics. The sum of the observed number of prehension bites and mastication chews during eating were used as a reference for the number of eating chews.

Table 6 presents the validation results of the behavioral characteristics evaluated with C2 and C11 for the supplemented grazing cows. The MADP between C2 and the directly observed data were numerically smaller for prehension bites and prehension time when compared with C11. Concerning chews per bolus, number of rumination chews, and rumination time, MADP were numerically larger when raw data were evaluated by C2. Similar MADP between the 2 converter versions and direct observation were found for bolus counts, number of eating chews, and time spent eating. Furthermore, the slopes of the regression lines drawn between C2, C11 and observed data for all behavioral characteristics, except prehension bites (about 1.2) and time (about 1.3), ranged between 0.91 and 1.01. The

RPE and the LoA for all behavioral characteristics were smaller between direct observation and when recorded data were evaluated using C11 compared with C2. Differences between observation and data evaluation by C2 and C11 were found for bolus counts ($P = 0.004$ and $P < 0.001$, respectively), prehension bites (both $P < 0.001$), prehension time (both $P < 0.001$), number of eating chews ($P < 0.001$ and $P = 0.003$, respectively), and eating time ($P = 0.001$ and $P < 0.001$, respectively).

For the supplemented grazing cows, C2 and C11 showed no differences for prehension bites ($P = 0.12$), prehension time ($P = 0.12$), number of eating chews ($P = 0.11$), eating time ($P = 0.11$), number of rumination chews ($P = 0.12$), time spent for rumination ($P = 0.14$), bolus counts ($P = 0.14$), and chews per bolus ($P = 0.39$; Table 4). This indicates that both converters performed equally well.

Table 4. Comparison of RumiWatch Converters 0.7.3.2 and 0.7.3.11 (Itin and Hoch GmbH, Liestal, Switzerland) in evaluating different behavioral characteristics

Item	Bias	<i>P</i> -value ¹	LoA ²	
			LCL	UCL
Supplemented cows ³				
Prehension bites	-2.4	0.54	-87	82
Prehension time	-1.9	0.59	-78	74
Eating chews	-2.4	0.54	-87	82
Eating time	-1.9	0.59	-78	74
Rumination chews	3.0	0.43	-81	87
Rumination time	3.1	0.57	-116	122
Bolus count	0.03	0.38	-0.8	0.8
Chews per bolus	0.2	0.86	-21	22
Grazing cows ⁴				
Prehension bites	-11.9	0.009	-189	165
Prehension time	-9.9	0.008	-156	136
Eating chews	-11.9	0.009	-189	165
Eating time	-9.9	0.008	-156	136
Rumination chews	11.6	0.009	-162	185
Rumination time	9.8	0.008	-134	153
Bolus count	0.04	0.16	-1.1	1.1
Chews per bolus	0.4	0.33	-15	16
Supplemented grazing cows ⁵				
Prehension bites	-6.4	0.12	-131	118
Prehension time	-6.4	0.12	-131	118
Eating chews	-5.7	0.11	-114	103
Eating time	-5.7	0.11	-114	103
Rumination chews	6.4	0.12	-117	130
Rumination time	6.2	0.14	-119	132
Bolus count	0.06	0.14	-1.1	1.3
Chews per bolus	0.7	0.39	-24	26

¹H₀: bias = 0.

²LoA = limits of agreement; LCL = lower control limit; UCL = upper control limit.

³Data collected from supplemented cows staying in the barn.

⁴Data collected from all cows during grazing.

⁵Data collected from supplemented cows staying both in the barn and on pasture.

Manual Evaluation of the RumiWatch Raw Data

Figure 2 shows the relations between the manually counted, based on the RWV and automatically evaluated (C2) number of eating chews versus the directly observed ones for problematic cases ($n = 17$). Since problematic records were used, the coefficient of determination was low ($R^2 = 0.33$) between observed and automatically evaluated (C2) eating chews, but between observed and manually counted eating chews it was high ($R^2 = 0.97$). This indicates that a high accordance exists between the observer and the records of the RWH in counting the number of eating chews.

DISCUSSION

Data Collection and Procedural Considerations

In our study, short, continuous, and direct observation sequences lasting 10 min were used for comparison with sensor-based data recordings and processing, because short sequences showed greater deviations than long ones (Bikker et al., 2014), and therefore more weak points are discovered. This was caused by the fact that the C2 and C11 algorithms were able to evaluate the raw data for 10-min summaries but were actually developed for measuring periods of 1 h. However, it would be very difficult to observe and correctly log the cows' quickly changing behavioral sequences over a span of 1 h. On the other hand, continuous observation allows the comparison of the number of single jaw movements or boluses, and consequently increases the accuracy of the validation when compared with instantaneous sampling; therefore, the former was preferred. Although continuous observation is the current reference method in recording how frequent and for how long an animal performs a behavior (Chen et al., 2016), loss of concentration and different recording practices between individuals can lead to errors. Penning (1983) stated that automatic recording systems are capable of recording behavior in far more detail than an observer in direct observation. This lies in their greater measuring capacity and, therefore, their greater measurement coverage during both day and night. Rutter et al. (1997) stated that the IGER Behavior Recorder shows the same accuracy as observers in recording foraging behavior, although there was a mean index of concordance of 91%. The difference to 100% was attributed to the difficulties of the observer to correctly detect foraging behavior.

Data loss due to technical problems in our study amounted to 21%. Unfortunately, few studies have reported the extent and causes of data loss that have occurred during their investigations, and they have not

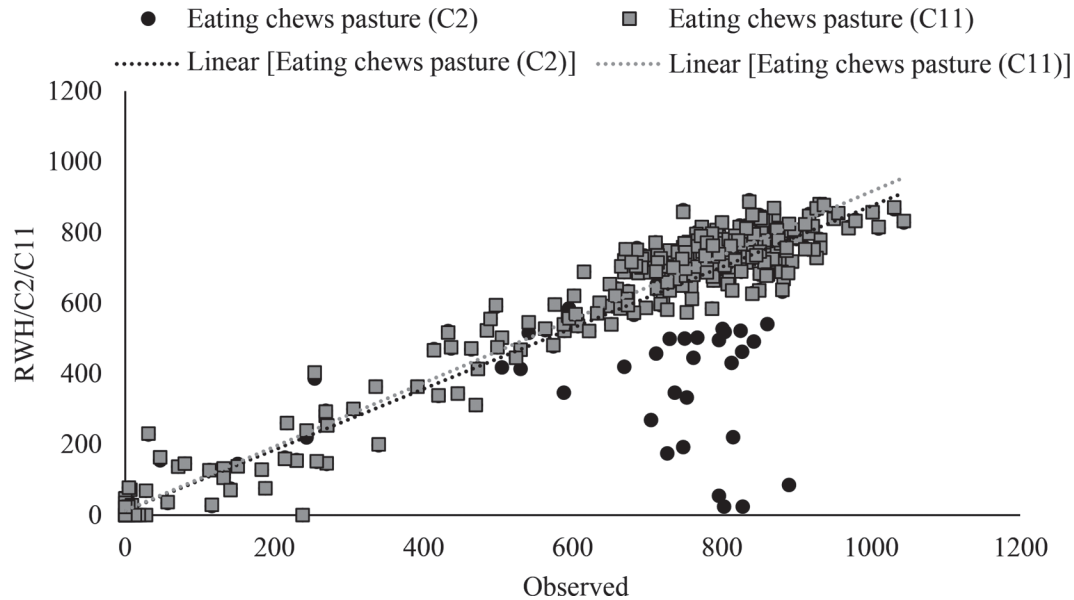


Figure 4. Relation of automatically evaluated [RumiWatch Converters 0.7.3.2 (C2) and 0.7.3.11 (C11); Itin and Hoch GmbH, Liestal, Switzerland] number of eating chews performed by grazing cows versus observed number of eating chews (n = 336 observations). RWH = RumiWatch Halter.

Table 5. Accuracy of RumiWatch Converters 0.7.3.2 (Converter 2) and 0.7.3.11 (Converter 11) compared with direct observation in evaluating behavioral characteristics performed by the grazing cows¹

Item	n	V ²	RW ²	MADP	Bias ³	P-value ⁴	LoA		Regression from direct to RW			
							LCL	UCL	Intercept estimate	Slope estimate	MPE	RPE
Converter 2												
Prehension bites	320	607	715	22	−70.2	<0.001	−302	162	23.9	1.09	118	0.19
Prehension time	320	448	598	36	−98.4	0.001	−320	123	42.7	1.15	109	0.24
Eating chews	336	774	715	14	57.3	<0.001	−169	284	3.98	0.89	106	0.14
Eating time	336	572	598	11	−15.1	<0.001	−191	161	12.2	0.99	90.3	0.24
Rumination chews	78	577	583	33	−12.3	0.008	−192	168	15.8	0.99	93.8	0.16
Rumination time	78	600	579	27	−10.8	0.005	−161	140	12.2	1.00	79.2	0.13
Bolus count	78	11	10	16	0.05	0.21	−1.5	1.6	0.02	0.94	0.77	0.07
Chews per bolus	78	54	57	32	−0.7	0.22	−23	22	0.54	1.01	12.0	0.22
Converter 11												
Prehension bites	320	607	723	17	−84.6	<0.001	−222	53	25.8	1.12	60.3	0.10
Prehension time	320	448	599	27	−111	<0.001	−271	48	42.6	1.18	71.7	0.16
Eating chews	336	774	723	11	41.5	<0.001	−86	169	11.6	0.91	51.5	0.07
Eating time	336	572	598	7	−24.9	<0.001	−112	62	13.4	1.02	43.6	0.16
Rumination chews	78	577	605	6	0.4	0.71	−40	41	−0.27	1.00	20.2	0.03
Rumination time	78	600	598	4	−0.4	0.62	−34	33	−0.64	1.01	17.1	0.03
Bolus count	78	11	11	9	0.09	<0.001	−0.8	1.0	−0.04	0.95	0.41	0.04
Chews per bolus	78	54	57	14	−0.3	0.32	−11	10	0.11	1.03	5.40	0.10

¹n = number of included records and observations. V = visual: median for number of, and time spent in, different behaviors observed directly (s/600 s; bites or chews/10 min). RW = RumiWatch (Itin and Hoch GmbH, Liestal, Switzerland): median for amount of time spent in different behaviors recorded by the RW Halter (s/600 s; bites or chews/10 min). MADP = mean absolute deviation percent. LoA: limits of agreement. LCL = lower confidence limit. UCL = upper confidence limit. MPE = mean prediction error (s/600 s; bites or chews/10 min). RPE = relative prediction error.

²The median is less sensitive to extreme values compared with the arithmetic mean.

³The bias is the fixed effect of the reference method (visual) compared with the instrumental method as estimated by the function rlmer of the R package robustlmm (Koller, 2014). It may be interpreted as the mean systematic error of the instrumental method.

⁴H₀: bias = 0.

stated the exclusion criteria used to reject the data from further evaluation. Oudshoorn et al. (2013) mentioned a large number of missing values, due to lost data packages, when using di- and triaxial accelerometers. Chambers et al. (1981) recorded data loss of 9 to 24% when using a bitemeter, and between 9 and 15% by using a VibraCorder for the detection of ingestive behavior in sheep and cows; our proportion of data loss is thus similar to previous studies. However, a lower data loss would be desirable.

Regarding the primary results of problematic cases, the RWH recorded the number of eating chews accurately, but allocation by C2 was incorrect (Figure 2). Consequently, the MADP for the number of eating chews for poorly matching data pairs (observations vs. automatic records) was substantially reduced from 70 to 4% when evaluated manually. This finding led to the development of a new algorithm integrated in C11. In contrast to C2, C11 uses data taken with the pressure sensor and the triaxial accelerometer to differentiate between behavioral characteristics. The combination of data from both sensors for the evaluation of ingestive

and rumination behaviors may increase the number of detectable behavioral characteristics and their accuracy. To our knowledge, until now, no other device has been able to offer the combination of a pressure sensor and a triaxial accelerometer to differentiate between ingestive and rumination behaviors. Instead, previous studies have used pressure sensors and triaxial accelerometers separately. Nonetheless, detection of single jaw movements during eating cannot currently be achieved with a triaxial accelerometer alone (Nydegger et al., 2011b).

Although C11 showed greater accuracy than C2 for several of the behavioral characteristics of grazing dairy cows, the development of RWS is not yet complete. With regard to the prospective estimation of the feed intake of grazing cows using the RWS, differentiation between mastication chews and prehension bites is important (Laca and WallisDeVries, 2000) and should therefore be integrated into the algorithm in future. Subsequently, the RWS will need to be validated, as it ought to be, whenever its hardware or software is modified, or when its area of application changes (Huber, 2013).

Table 6. Accuracy of RumiWatch Converters 0.7.3.2 (Converter 2) and 0.7.3.11 (Converter 11) compared with direct observation in evaluating behavioral characteristics performed by the supplemented grazing cows¹

Item	n	V ²	RW ²	MADP	Bias ³	P-value ⁴	LoA		Regression from direct to RW		MPE	RPE
							LCL	UCL	Intercept estimate	Slope estimate		
Converter 2												
Prehension bites	121	593	691	39	−75.6	<0.001	−423	272	−36.8	1.22	153	0.26
Prehension time	121	416	598	57	−89.5	<0.001	−355	177	−0.81	1.29	121	0.29
Eating chews	155	732	691	15	26.9	<0.001	−189	243	−15.7	0.91	95.3	0.13
Eating time	155	540	598	13	−16.1	0.001	−164	131	6.96	1.01	75.2	0.14
Rumination chews	74	590	591	12	−4.5	0.25	−121	112	11.1	1.01	57.9	0.10
Rumination time	74	599	598	10	−3.7	0.34	−120	112	6.97	1.00	56.8	0.09
Bolus count	74	11	11	11	0.20	0.004	−1.8	2.2	0.09	0.94	0.92	0.08
Chews per bolus	74	51	55	28	−1.1	0.34	−35	33	1.30	1.01	16.7	0.33
Converter 11												
Prehension bites	121	593	697	40	−88.1	<0.001	−421	245	−18.5	1.23	145	0.24
Prehension time	121	416	598	59	−101	<0.001	−360	158	15.7	1.29	116	0.28
Eating chews	155	732	697	15	18.9	0.003	−172	210	1.06	0.91	85.7	0.12
Eating time	155	540	598	13	−23.8	<0.001	−158	111	19.8	1.01	68.9	0.13
Rumination chews	74	590	599	10	1.7	0.51	−78	81	0.12	1.00	40.3	0.07
Rumination time	74	599	598	7	1.3	0.57	−66	69	−3.01	1.00	34.5	0.06
Bolus count	74	11	11	11	0.26	<0.001	−1.4	2.0	−0.05	0.93	0.75	0.07
Chews per bolus	74	51	55	23	−0.2	0.78	−23	22	−0.51	1.01	11.8	0.23

¹n = number of included records and observations. V = visual: median for number of, and time spent in, different behaviors observed directly (s/600 s; bites or chews/10 min). RW = RumiWatch (Itin and Hoch GmbH, Liestal, Switzerland): median for amount of time spent in different behaviors recorded by the RW Halter (s/600 s; bites or chews/10 min). MADP = mean absolute deviation percent; LoA = limits of agreement; LCL = lower confidence limit; UCL = upper confidence limit; MPE = mean prediction error (s/600 s; bites or chews/10 min); RPE = relative prediction error.

²The median is less sensitive to extreme values compared with the arithmetic mean.

³The bias is the fixed effect of the reference method (visual) compared with the instrumental method as estimated by the function `rlmer` of the R package `robustlmm` (Koller, 2014). It may be interpreted as the mean systematic error of the instrumental method.

⁴H₀: bias = 0.

Validation of RumiWatch Halter Data Evaluated Using C2 and C11

Prehension Bites and Time. Currently, it is possible to discriminate raw data measured by the RWH into rumination, eating, drinking, and other activities (Büchel, 2014; Ruuska et al., 2016), but C2 and C11 do not differentiate between mastication and true prehension bites while eating. Therefore, the number of prehension bites is overestimated for grazing cows and even more for supplemented cows. The higher overestimation of prehension bites for supplemented cows may be due to the higher share of mastication chews in the barn.

Eating Chews. The deviations (MADP) between the observed and automatically evaluated number of eating chews for supplemented cows (21 and 26%) were higher than the previously obtained standard error of the mean (SEM) of 9% observed by Zehner et al. (2012). Similarly, Nydegger et al. (2011b) found a mean disagreement of 12% between automatically and manually evaluated raw data for the number of eating chews in housed dairy cows measured by the MSR behavior recorder. Differences in the accuracy of the sensors between the studies are difficult to interpret as measures of accuracy differ. A further tentative explanation for the differences between our study and that of Nydegger et al. (2011b) may be that individual behavioral characteristics contain individual animal specificities (Nydegger et al., 2011a). Therefore, the pressure signals may vary and the C2 or C11 algorithms may not have always been able to correctly allocate signals to a behavior. For grazing cows, the MADP of C11 for eating chews results shows that they correspond better to the observations than those of C2 (11 vs. 14%) and are comparable to the aforementioned SEM of 9% for the number of eating chews in the barn reported by Zehner et al. (2012). The use of the pressure sensor and the triaxial accelerometer by C11 may explain the lower deviation. With C11, irregular chew frequencies detected by the pressure sensor coupled with increased acceleration in all 3 axes were associated with the number of eating chews. Gathering herbage with the tongue and ripping it off from the sward leads to upward (Phillips, 2002) and sideward movements of the head, which may explain these increased accelerations. González et al. (2015) also noted increased acceleration for the cattle's head during grazing, when a triaxial accelerometer was mounted on a collar under the neck. Based on low RPE of ≤ 0.10 for 10-min observation sequences, the accuracy of RWH coupled with C11 to detect the number of eating chews is sufficient for grazing cows.

Rumination Chews. Automatically recorded numbers of rumination chews for grazing cows and supple-

mented cows showed a comparatively small deviation from the observation (MADP of about 10%), except for grazing cows when raw data were evaluated by C2. This is consistent with the original approach to develop an automatic health-monitoring tool. The rumination process is essential for the fermentation and digestion of ingested feed (Murphy et al., 1983), and is influenced by different external conditions (Soriani et al., 2012); therefore, its monitoring may be a useful element when assessing the health status of ruminants. However, the deviations between the recorded and observed number of rumination chews in our study were higher than they were in Zehner et al. (2012), who reported a SEM of only 4%. As previously explained, the longer observation sequences used by Zehner et al. (2012) may partly account for the lower deviations. The lowest MADP in our investigation was found for rumination chews when measured for grazing cows and evaluated with C11 (6%). Similar results were obtained by Rutter et al. (1997), who determined a concordance index of 93% for time spent ruminating by grazing dairy cows; this implies a deviation to direct observation of 7% of the IGER Behavior Recorder. Better differentiation between rumination and eating was achieved with C11 when data from the triaxial accelerometer were included. Signals of lower amplitude from a triaxial accelerometer during rumination compared with eating were already described by González et al. (2015). Based on a low RPE of ≤ 0.10 for 10-min observation sequences, the accuracy of the RWH data processed with C11 in detecting the number of rumination chews is acceptable under different conditions.

Eating and Rumination Time. Estimations of time spent eating and ruminating generally exhibit a lower MADP when compared with counts of rumination and eating chews. Delagarde and Lamberton (2015) obtained with a uniaxial accelerometer (LifeRecorder Plus) a lower RPE for the estimation of grazing time compared with our study (12 vs. 16%), even if C11 was used. Blomberg (2011) reported a higher deviation for eating time measured by the HOB0 logger (biaxial accelerometer) compared with our study [16 vs. 11% (C2) and 7% (C11)]. Additionally, the MADP for the rumination time of supplemented cows, measured with the RWH, was lower than the deviation from observation measured by the IGER Behavior Recorder [6% (C2) and 7% (C11) vs. 10%; Kononoff et al., 2002]. The reason for the higher overall MADP for eating time (15.7%) and lower overall MADP for rumination time (10.2%) may be explained by the function modes of the C2 and C11 algorithms: time sequences, which were not assigned to rumination or other activities, were allocated as eating time and thus led to an overestimation of the latter. Furthermore, the same algorithm was

used for the evaluation of 10-min and 1-h files, which also led to reduced accuracy. For example, rumination bouts have to last at least 3 min to be allocated as rumination by C2 and C11; otherwise, this time and the performed chews are classified as eating. The probability of including rumination bouts shorter than 3 min is higher in 10-min observation sequences compared with 1-h evaluation files. Consequently, the shorter length of evaluation files may partly explain greater deviations in our study, because, in most of the studies cited above, observation sequences of 1 h or longer were used.

Bolus Counts. The mean MADP compared with observation for bolus counts was 12%, which is similar to the MADP of rumination chews. This is understandable, given that the C2 and C11 algorithms use the chewing interruption between 2 boluses to differentiate between rumination and eating. Each chewing interruption with a definite duration, starting with the first regurgitation of a bolus at the beginning of a rumination bout, is counted as 1 bolus. Based on low RPE of ≤ 0.10 for 10-min observation sequences, the precision of the RWH, coupled with C11 or C2 to detect the bolus counts, is sufficient under most conditions. Although bolus counts and rumination chews per bolus are important variables used to detect disorders in ruminants, these variables have not often been validated.

Chews Per Bolus. The mean MADP, compared with visual observation for chews per bolus, were higher (24 vs. -0.2%) than the mean deviation found by Nydegger et al. (2011b) who observed a deviation between automatically and manually evaluated raw data measured by the MSR behavior recorder. Moreover, Zehner et al. (2012) detected a lower SEM of 15%. One reason for the higher deviations could be that the errors for the numbers of rumination chews and bolus counts are cumulated in their quotient, which could have led to a deviation of this magnitude.

CONCLUSIONS

Feeding behavior measured by the RWS and evaluated by 2 versions of the RumiWatch Converter (C2 and C11) shows variable results that were, in part, related to feeding conditions. Looking at the accuracy of the detected behavioral characteristics, performed by supplemented grazing or by supplemented cows, it did not matter which converter was used as the 2 versions performed equally well. However, more reliable results were obtained by using C11 for grazing cows, for total number of eating chews, number of rumination chews, prehension bites, and times spent engaging in these activities. Moreover, the RWS is a useful research tool for recording bolus counts, number of rumination

chews, total number of eating chews, and time spent in rumination for grazing cows and supplemented grazing cows, when the raw data are processed by C11. For supplemented cows, the RWS is useful for recording bolus counts, rumination chews, and time. With regard to the prospective herbage intake estimation on pasture by the RWS, a new algorithm may be developed that reliably enables differentiation between mastication and prehension bites while eating. Furthermore, the improvement of the evaluation software is not yet finished; this, as well as validation of the system, should be continued in further studies.

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